

# Assignment 1 - written parts

Tuesday, September 15, 2020 10:01 PM

## 1. derivative @ $(x \pm dx)$

$$f'_1(x) = \frac{f(x+dx) - f(x-dx)}{2dx}$$

$$f(x+dx) = f(x) + dx f'(x) + \frac{dx^2 f''(x)}{2} + \frac{dx^3 f'''(x)}{6} + \frac{dx^4 f''''(x)}{24} + \frac{dx^5 f''''(x)}{120} + \dots + g_1 \epsilon f(x)$$

$$f(x-dx) = f(x) - dx f'(x) + \frac{dx^2 f''(x)}{2} - \frac{dx^3 f'''(x)}{6} + \frac{dx^4 f''''(x)}{24} - \frac{dx^5 f''''(x)}{120} + \dots + g_0 \epsilon f(x)$$

$$f'_1(x) = \frac{2dx f'(x) + (\frac{1}{3})dx^2 f''(x) + (\frac{1}{60})dx^3 f'''(x) + \dots + (g_1 - g_0)\epsilon f(x)}{2dx}$$

$$f'_1(x) = f'(x) + \frac{1}{6}dx^2 f''(x) + \frac{1}{120}dx^4 f''''(x) + \dots + \underbrace{g_1 \epsilon f(x)}_{2dx} \quad g_1 = g_1 - g_0$$

derivative at  $x \pm 2dx$ :

$$f'_2 = \frac{f(x+2dx) - f(x-2dx)}{4dx}$$

$$f(x+2dx) = f(x) + 2dx f'(x) + \frac{4dx^2 f''(x)}{2} + \frac{8dx^3 f'''(x)}{6} + \frac{16dx^4 f''''(x)}{24} + \frac{32dx^5 f''''(x)}{120} + \dots + g_2 \epsilon f(x)$$

$$f(x-2dx) = f(x) - 2dx f'(x) + \frac{4dx^2 f''(x)}{2} - \frac{8dx^3 f'''(x)}{6} + \frac{16dx^4 f''''(x)}{24} - \frac{32dx^5 f''''(x)}{120} + \dots + g_3 \epsilon f(x)$$

$$f'_2(x) = \frac{4dx f'(x) + (\frac{8}{3})dx^2 f''(x) + (\frac{8}{15})dx^3 f'''(x) + \dots + (g_2 - g_3)\epsilon f(x)}{4dx}$$

$$f'_2(x) = f'(x) + \frac{2}{3}dx^2 f''(x) + \frac{2}{15}dx^4 f''''(x) + \dots + \underbrace{g_2 \epsilon f(x)}_{4dx} \quad g_2 = (g_2 - g_3)$$

To eliminate third-order term:

$$f'(x) = \frac{4f'_1(x) - f'_2(x)}{3} = \frac{4f'(x) - f'(x) + (\frac{2}{3})dx^2 f''(x) - (\frac{2}{3})dx^2 f'''(x) + (\frac{1}{30})dx^4 f''''(x) - (\frac{2}{15})dx^4 f''''(x) + \dots + (\frac{1}{4}dx)(4g_1 - \frac{1}{4}g_2)\epsilon f(x)}{3}$$

$$f'(x) = f'(x) - \frac{1}{10}dx^4 f''''(x) + \dots + \underbrace{\frac{1}{dx} g_f \epsilon f(x)}_{g_f = (4g_1 - \frac{1}{4}g_2)} \quad g_f = (4g_1 - \frac{1}{4}g_2)$$

minimize error to find best  $dx$

$$\frac{\partial \text{error}}{\partial dx} = -\frac{4}{10}dx^3 f''(x) - g_f \frac{\epsilon f(x)}{dx^2} = 0$$

$$-\frac{2}{5}dx^3 f''(x) = g_f \frac{\epsilon f(x)}{dx^2}$$

$$dx^3 = -\frac{5g_f \epsilon f(x)}{2f''(x)}$$

$$\boxed{dx = \sqrt[3]{-5g_f \epsilon f(x)}} \quad \text{... } L \rightarrow \infty \text{ ... } n \text{ ... } \text{eighth iteration } L \approx 1.1$$

$$dx = -\frac{5g_f \epsilon + \epsilon}{2f''(x)}$$

$$dx = -\sqrt[5]{\frac{5g_f \epsilon f(x)}{2f''(x)}} , \text{ where } f^5(x) \text{ is the 5th derivative of } f(x) \\ \epsilon \text{ is the machine precision} \\ g_f \text{ is some random number of order unity}$$

for double precision:  $\epsilon \sim 10^{-16}$

then, assuming  $f(x)$  and  $f^5(x)$  have similar orders of magnitude,

$$|dx| \sim (10^{-16})^{1/5} \sim 10^{-3}$$

as  $dx$  gets smaller than that, error should not get better.

Ex:

$$f(x) = e^x \rightarrow f^5(x) = e^x \rightarrow dx = -\sqrt[5]{\frac{5g_f \epsilon}{2}} \approx 10^{-3.2}$$

$$f(0.01x) = e^{0.01x} \rightarrow f^5(x) = (0.01)^5 e^{0.01x} \rightarrow dx = -\sqrt[5]{\frac{5g_f \epsilon (1)^5}{2(0.01)}} \approx \left(\frac{10^{-16}}{10^{-10}}\right)^{1/5} = 10^{-1.2}$$

### Problem 1 Code Output:

$dx$ , approximate derivative, and error in  $\exp(x)$

-5.0	2.7182818284769237	1.78785749935367e-11
-4.555555555555555	2.7182818284475636	1.1481482431463519e-11
-4.111111111111111	2.7182818284582324	8.126832540256146e-13
-3.6666666666666667	2.718281828459375	3.299582829185965e-13
<b>-3.222222222222223</b>	<b>2.718281828459258</b>	<b>2.1271873151818e-13</b>
-2.7777777777777777	2.7182818284582937	7.513989430663059e-13
-2.3333333333333335	2.7182818284170067	4.203837278282663e-11
-1.8888888888888893	2.718281825937717	2.5213280352431866e-09
-1.4444444444444446	2.7182816772902227	1.5116882234877949e-07
-1.0	2.7182727567264906	9.071732554488676e-06

$dx$ , approximate derivative, and error in  $\exp(0.01x)$

-5.0	1.0100501670754862	0.9999496654046446
-4.555555555555555	1.010050167088373	0.9999496654175314
-4.111111111111111	1.0100501670838173	0.9999496654129757
-3.6666666666666667	1.0100501670839959	0.9999496654131542
-3.222222222222223	1.010050167084273	0.9999496654134313
-2.7777777777777777	1.010050167083894	0.9999496654130523
-2.3333333333333335	1.0100501670685145	0.9999496653976728
-1.8888888888888893	1.0100501661473054	0.9999496644764637
-1.4444444444444446	1.0100501109133586	0.999949609242517
<b>-1.0</b>	<b>1.0100467962398032</b>	<b>0.9999462945689616</b>

### Comments:

For  $\exp(x)$ , the minimum error occurs when the exponent of  $dx$  is approximately -3.2, as predicted.

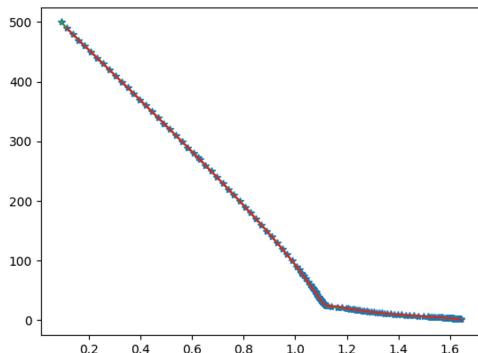
Similarly, for  $\exp(0.01)$ , the error is approximately constant as  $dx$  shrinks, which makes sense given our calculation of a minimum error when  $dx$  is approximately 0.1

### Problem 2 Code Output:

Please input the desired voltage:

1.0 (entered by user)

The temperature calculated using the polynomial fit is 92.89954807119172 Kelvin.  
 And the temperature calculated using the cubic spline fit is 92.8996409775585 Kelvin.  
 The approximate error in the polynomial fit is 0.05008394883489402  
 The approximate error in the cubic spline fit is 0.005869676742489251



$$3. f(x) = \frac{1}{1+x^2}$$

$$\text{rational function: } y(x) = \frac{p(x)}{q(x)} = \frac{1 + p_1x + p_2x^2 + \dots}{1 + q_1x + q_2x^2 + \dots} + g \approx y(x)$$

$$\text{for fit: } p_1 = p_2 = p_3 = \dots = p_n = 0$$

$$q_1 = 0, q_2 = q_3 = \dots = q_n = 0$$

The error should be very small as long as  $m \geq 2$ .

It should depend almost entirely on the machine precision, which for double precision is  $10^{-16}$ .

At higher orders, my code agrees with this.

### Problem 3 Output:

The error in the polynomial interpolation of cosine is 3.191294279758451e-10

The error in the cubic spline interpolation of cosine is 1.339538690066989e-05

The error in the rational function interpolation of cosine is 9.317498652501655e-09

The error in the polynomial interpolation of the lorentzian is 6.497210473164695e-05

The error in the cubic spline interpolation of the lorentzian is 4.5256398513655765e-05

The error in the rational function interpolation of the lorentzian is 34.32638275518651

The error in the rational function interpolation with np.linalg.pinv() is 8.637779136644075e-16

The error in the four-point rational function interpolation of the lorentzian is

9.78238469250138e-17

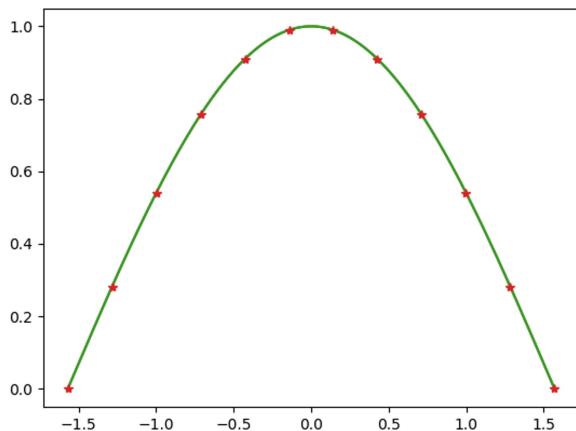
The error in the four-point rational function interpolation with np.linalg.pinv() is

9.78238469250138e-17

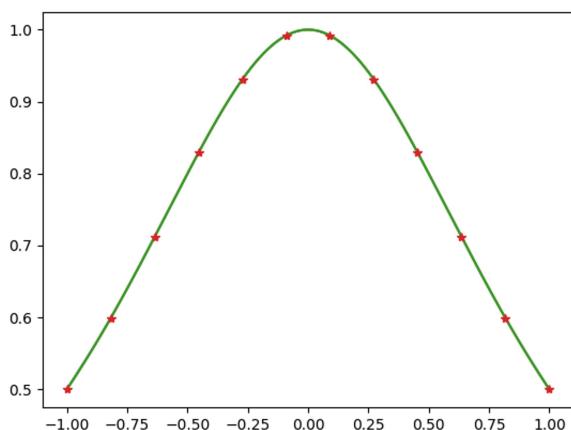
### Comments:

When you switch from np.linalg.inv() to np.linalg.pinv, it makes no difference for low-order fits. However, as the order increases the determinant of the matrix approaches 0, so the np.linalg.inv() creates a spike that greatly increases the error while the fit and error using np.linalg.pinv() stays very small. At these higher orders, the p and q calculated using

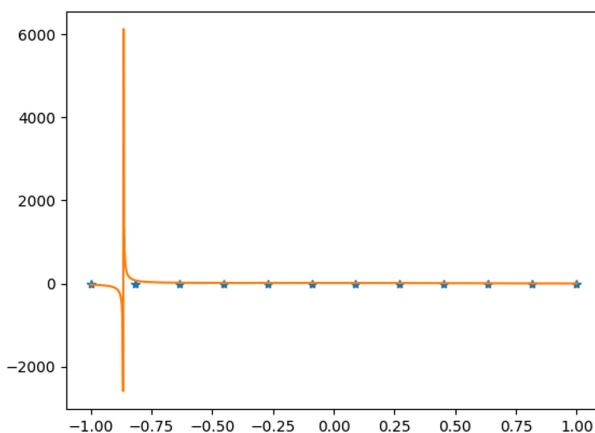
`np.linalg.inv()` are large because the multiplication factor used to find the inverse (1/determinant) becomes large.



All fits for cosine function (12 points each)

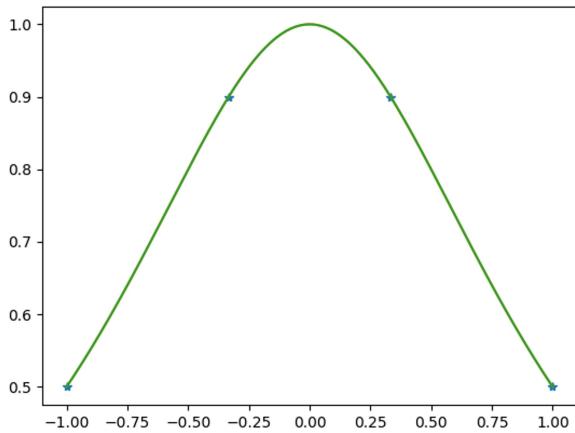


All fits for Lorentzian with 12 points. For the rational function fit, `np.linalg.pinv()` is used for this higher order fit.



Lorentzian rational function fit using `np.linalg.pinv()` at high order (n=6, m=7)  
Using this command gives a poor fit because the matrix mat has a

determinant very close to zero at high orders, meaning that its inverse values, which are being multiplied by  $1/\text{determinant}$ , are very large.



Rational function fits for the Lorentzian with four points each.

Both the `np.linalg.inv()` and the `np.linalg.pinv()` calculations provide a good fit here, because the higher order terms in the matrix that cause the determinant to approach zero are not included.

#### Problem 4 Output:

The error in my integrator was approximately 42626.50338994352

And the error in the scipy integrator was approximately 3.1063102137504287e-06

#### Comments

There is a singularity in the integral at  $z=R$ .

My integrator cannot handle this singularity, as it leads to an infinite loop when trying to calculate the integral at  $z=R$ . Therefore, the point  $z=R$  was excluded from calculating the integral using my integrator. However, the `scipy.integrate.quad` had no problems.

